**Sensors, Signals and Noise** 

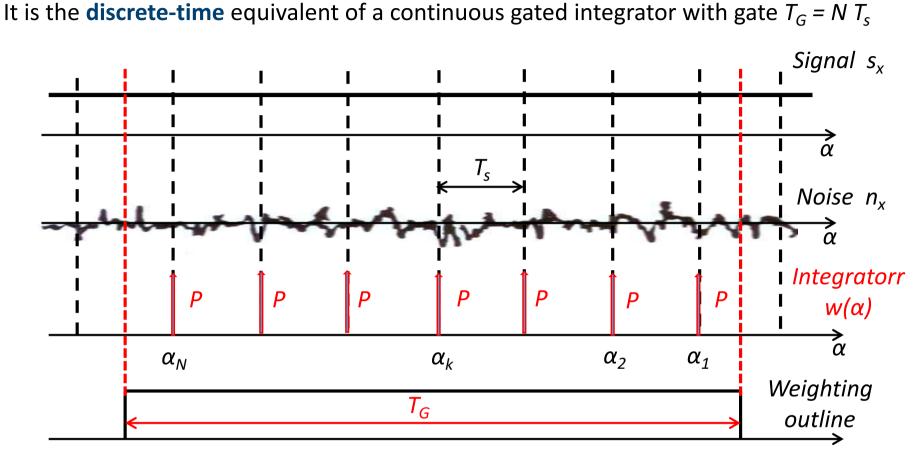
# COURSE OUTLINE

- Introduction
- Signals and Noise
- Filtering: LPF3 Switched-Parameter Averaging Filters
- Sensors and associated electronics

- Discrete Time Integrator (DTI)
- Discrete Time Integrator versus Gated Integrator
- Boxcar Integrator (BI)
- Ratemeter Integrator (RI)

# **Discrete-Time Integrator DI**

#### **Discrete-Time Integrator DI**



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- Samples taken with sampling frequency  $f_s = 1/T_s$  i.e. at intervals  $T_s$  within  $T_G$
- Input: DC-signal  $s_x$  and wide-band noise  $n_x$  (autocorrelation width  $2T_n \ll T_s$ )
- Every sample is multiplied by P and summed, up to a total  $N = T_G / T_s$  samples

#### **Discrete-Time Integrator**

With white noise, the GI gives  $S/N \propto \sqrt{T_G}$ ; we show now that the DI gives  $S/N \propto \sqrt{N}$ 

The output signal is

$$s_y = N \cdot P s_x$$
 (that is, the DC gain is  $G = N \cdot P$ )

The **output noise** is  $n_y = \sum_{k=1}^N P \cdot n_{xk}$  and

$$\overline{n_y^2} = P^2 \overline{(n_{x1}^2 + n_{x2}^2 \dots + n_{x1} n_{x2} + \dots}) = P^2 (\overline{n_{x1}^2} + \overline{n_{x2}^2} + \dots + \overline{n_{x1} n_{x2}} + \dots)$$

The noise samples are not correlated

and the noise is stationary 
$$\overline{n_{x1}n_{x2}} = \overline{n_{x2}n_{x3}} = \cdots = 0$$
  
Therefore

$$\overline{n_y^2} = N \cdot P^2 \overline{n_x^2}$$

By summing N samples the signal is increased by N and the rms noise by  $\sqrt{N}$ The SNR is thus improved by the factor  $\sqrt{N}$ 

$$\left(\frac{S}{N}\right)_{y} = \frac{s_{y}}{\sqrt{\overline{n_{y}}^{2}}} = \frac{N \cdot P s_{x}}{\sqrt{N \cdot P^{2} \overline{n_{x}}^{2}}} = \sqrt{N} \cdot \left(\frac{S}{N}\right)_{x}$$



#### **Discrete-Time Averager**

An averager is simply a discrete-time integrator with sampling weight *P* adjusted to give unity DC gain, that is  $G = N \cdot P = 1$ 

$$P = \frac{1}{N}$$

and therefore output signal equal to input

$$s_y = s_x$$

The output noise is reduced to

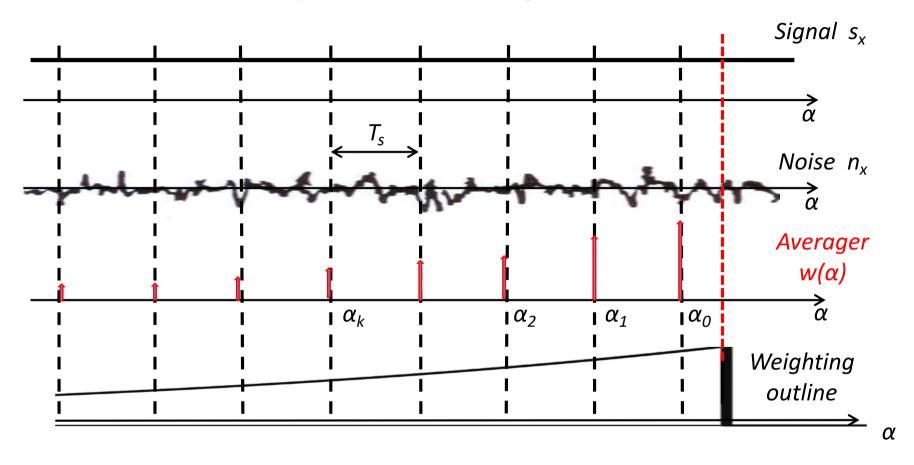
$$\overline{n_y^2} = N \cdot P^2 \overline{n_x^2} = \frac{1}{N} \cdot \overline{n_x^2}$$
$$\sqrt{\overline{n_y^2}} = \frac{\sqrt{\overline{n_x^2}}}{\sqrt{N}}$$

which corresponds to the enhancement of the S/N

$$\left(\frac{S}{N}\right)_{y} = \sqrt{N} \cdot \left(\frac{S}{N}\right)_{x}$$

### **Discrete-Time Exponential Averager**

It is the discrete-time equivalent of an RC integrator



- Samples are taken with sampling frequency  $f_s = 1/T_s$  i.e. at intervals  $T_s$
- Input: DC-signal  $s_x$  and wide-band noise  $n_x$  (autocorrelation width  $2T_n << T_s$ )
- The sample weight slowly decays with the sample «age»:  $w_k = Pr^k$  with (1 r) << 1

#### **Discrete-Time Exponential Averager**

**Output signal** 
$$s_y = s_x \cdot P \cdot \sum_{k=0}^{\infty} r^k = s_x \cdot P \frac{1}{1-r}$$
 (i.e, DC gain  $G = P \frac{1}{1-r}$ )

#### **Output mean square noise**

$$\overline{n_{y}^{2}} = P^{2}(\overline{n_{x0}^{2}} + r^{2} \cdot \overline{n_{x1}^{2}} + \dots + r^{2k} \cdot \overline{n_{xk}^{2}} + \dots + r^{k}r^{j} \cdot \overline{n_{xk}n_{xj}} + \dots)$$

The noise samples are not correlated  $(\overline{n_{xk}n_{xj}} = 0 \text{ for } k \neq j)$ and the noise is stationary  $(\overline{n_{x0}}^2 = \overline{n_{x1}}^2 = \cdots = \overline{n_x}^2)$ Therefore

$$\overline{n_{y}^{2}} = \overline{n_{x}^{2}} \cdot P^{2} \left( 1 + r^{2} + \dots + r^{2k} + \dots \right) = \overline{n_{x}^{2}} \cdot P^{2} \cdot \frac{1}{1 - r^{2}}$$

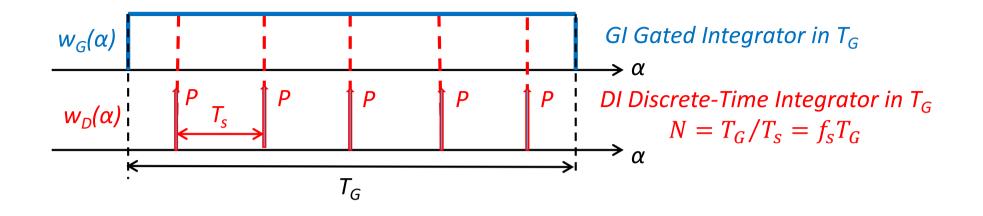
The SNR is thus improved to

$$\left(\frac{S}{N}\right)_{y} = \frac{s_{y}}{\sqrt{\overline{n_{y}^{2}}}} = \frac{Ps_{x}}{1-r} \frac{1}{\sqrt{\frac{\overline{n_{x}^{2}}P^{2}}{1-r^{2}}}} = \left(\frac{S}{N}\right)_{x} \sqrt{\frac{1+r}{1-r}}$$

But the attenuation ratio r is very close to unity  $(1 - r) \ll 1$  hence  $(1 + r) \approx 2$  and therefore

$$\left(\frac{S}{N}\right)_{y} \cong \left(\frac{S}{N}\right)_{x} \sqrt{\frac{2}{1-r}}$$

## Discrete-Time Integrator versus GI



**INPUT:** DC signal  $s_x$  and wide-band noise  $S_b$  (bandwidth  $2f_n >> f_s$ , correlation width  $2T_n << T_s$ ) with rms value  $\overline{n_x^2} = S_b 2f_n = S_b/2T_n$ 

With unity DC gain  $s_y = s_x$ 

- Noise reduction by GI
- Noise reduction by DI

$$\sqrt{\overline{n_{yG}}^2} = \sqrt{\overline{n_x}^2} / \sqrt{\frac{T_G}{2T_n}}$$
$$\sqrt{\overline{n_{yD}}^2} = \sqrt{\overline{n_x}^2} / \sqrt{N}$$

### **Discrete-Time Integrator vs. GI**

The improvement factor is

- $\sqrt{N}$  for the DI, increasing with the number N of samples taken
- $\sqrt{T_G/2T_n}$  for the GI, constant for a given  $T_G$

**QUESTION :** is it possible to attain with a DI better S/N improvement than a GI just by increasing the number N (i.e. by using very fast sampling electronics)?

#### ANSWER: NO !!

In fact , since  $N = T_G/T_s$  for having  $N > T_G/2T_n$  it must be

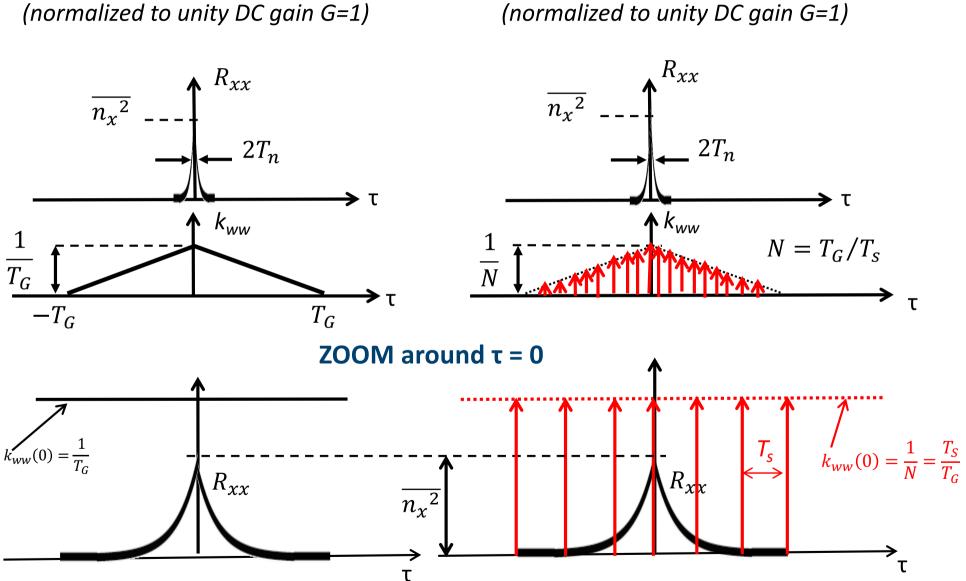
 $T_s < 2T_n$ 

in these conditions

- the samples are no more uncorrelated
- the improvement factor is **no more given by**  $\sqrt{N}$
- There is still an improvement factor, but it must be evaluated taking into account the correlation between the noise samples.
- It is anyway (S/N)<sub>DI</sub> ≤ (S/N)<sub>GI</sub> with (S/N)<sub>DI</sub> → (S/N)<sub>GI</sub> as N is increased, as we can demonstrate in time domain and in frequency domain

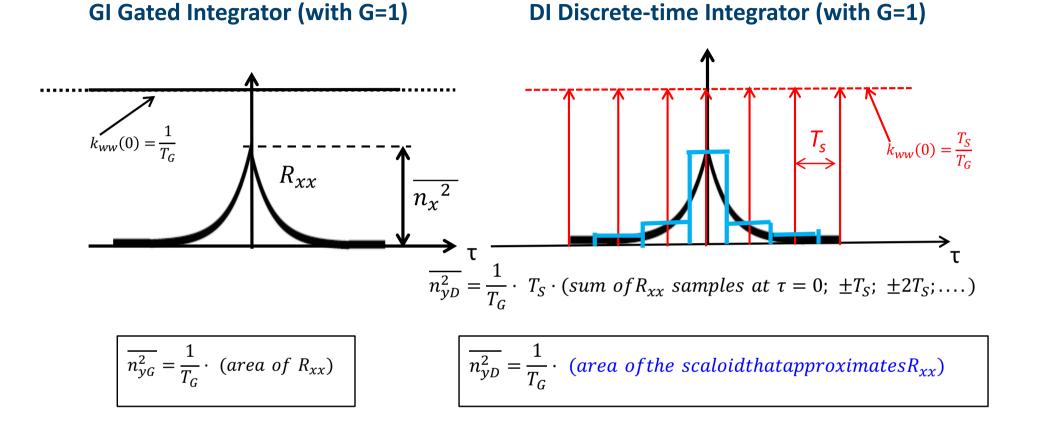
#### **Discrete-Time Integrator vs. GI (time domain)**

**GI Gated Integrator** 



**DI Discrete-time Integrator** (normalized to unity DC gain G=1)

#### **Discrete-Time Integrator vs. GI (time domain)**

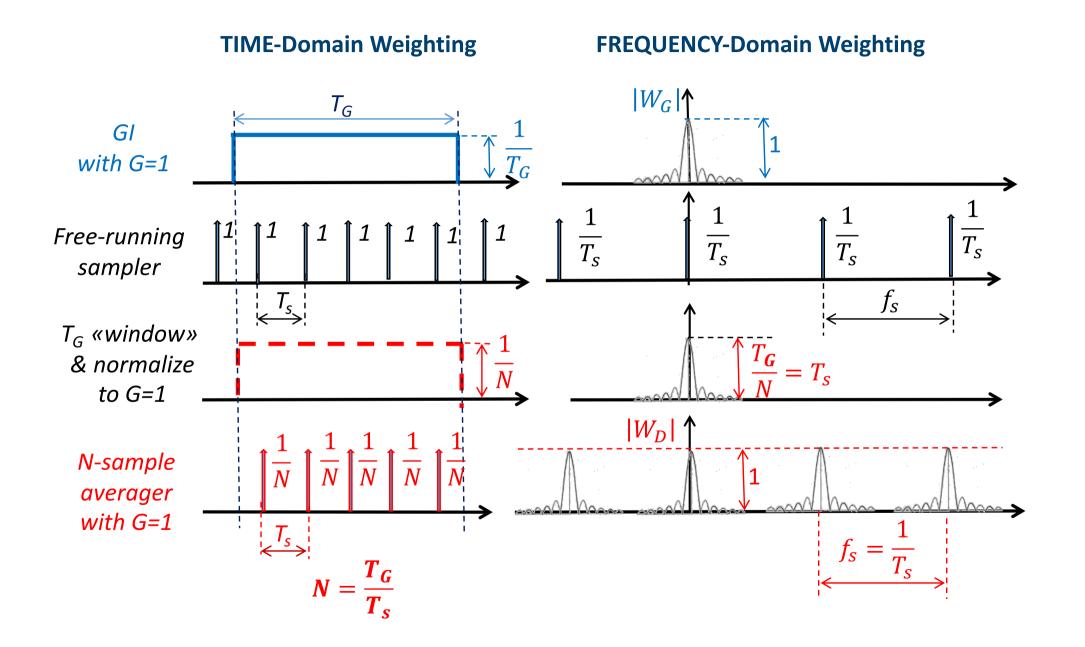


The scaloid area is greater than the  $R_{xx}$  area, therefore

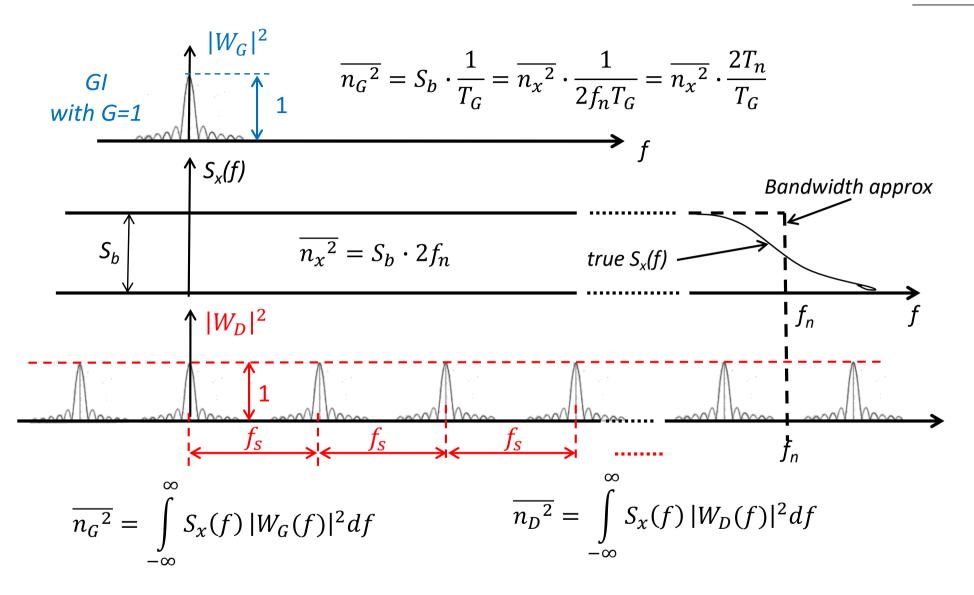
$$\overline{n_{yD}^2} \ge \overline{n_{yG}^2} = \overline{n_x^2} \cdot \frac{2T_n}{T_G} \quad \text{with} \quad \overline{n_{yD}^2} \to \overline{n_{yG}^2} \quad as \quad T_S \to 0$$

**Ivan Rech** 

#### **Discrete-Time Integrator vs. GI (frequency domain)**



### Noise filtering analysis: GI vs. DI (frequency domain)



The figure illustrates how the output noise  $\overline{n_D}^2$  is reduced and S/N is enhanced by increasing the sampling frequency  $f_s$  (for a given averaging time  $T_G$ )

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**Ivan Rech** 

### Noise filtering analysis: GI vs. DI

a) As long as  $f_s \ll f_n$ :

- the noise samples are uncorrelated
- each line of  $|W_D|^2$  is identical to  $|W_G|^2$  of the GI (with same DC gain G=1)
- a high number  $N_L$  of lines of  $|W_D|^2$  falls within the noise bandwidth  $2f_n$
- the output noise of the DI is  $N_L$  times that of the GI

$$\overline{n_D^2} = \overline{n_G^2} \cdot N_L$$

With good approximation it is

$$N_L \cong 2f_n/f_s$$

and it is confirmed that for uncorrelated samples the S/N increases as  $\sqrt{N}$ 

$$\overline{n_D^2} = \overline{n_x^2} \cdot \frac{1}{T_G f_S} = \frac{\overline{n_x^2}}{N}$$

#### b) When $f_s$ becomes comparable to $f_n$ or higher

- the previous result is no more valid.
- the output noise must be computed with the actual noise spectrum

$$\overline{n_D^2} = \int_{-\infty}^{\infty} S_x(f) |W_D(f)|^2 df \ge \overline{n_G^2}$$

• The figure shows that  $\overline{n_D^2}$  is always higher than  $\overline{n_G^2}$  and attains it for  $f_S \to \infty$ 

$$\lim_{f_S \to \infty} \overline{n_D^2} = \overline{n_G^2}$$

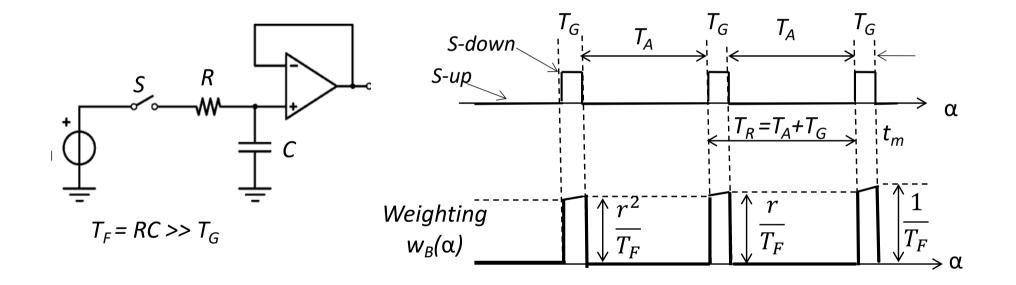
# **Boxcar Integrator BI**

## **Boxcar Integrator (BI)**

This simple analog circuit combines two functions:

- 1. Sample Acquisition by gated integration
- 2. Exponential averaging of samples

The circuit employed is the same of the Gated Integrator, but with a fundamental difference: the capacitor is **NOT RESET between the acquisitions.** 

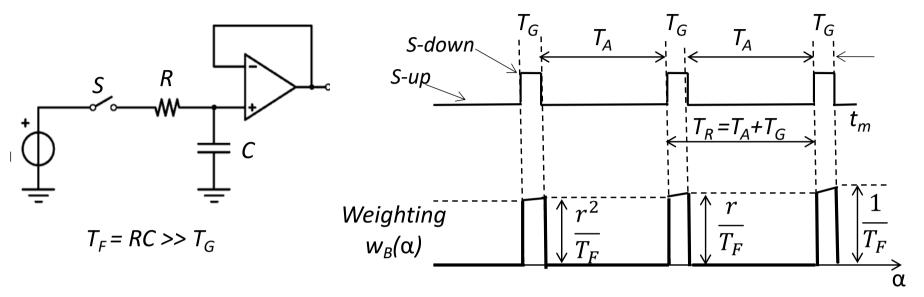


- In  $T_A$  the C is in HOLD state: nothing changes, no memory loss and no new charge input
- In  $T_G$  the discharge of C (memory loss) reduces the previously stored value by the factor  $\mathbf{r} = e^{-T_G/T_F}$ . NB: r does NOT depend on the interval  $T_A$

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#### **Boxcar Integrator (BI)**



- BI behaves as RC-integrator (RCI) when the switch is closed (S-down); it is in HOLD state when the switch is open (S-up)
- In fact, the weighting function  $w_B(\alpha)$  of the BI is obtained by subdividing  $w_{RC}(\alpha)$  of the RCI it in «slices» of width  $T_G$  and placing them over the S-down intervals
- G=1 : the DC gain of BI (area of  $w_B$ ) is unity (like that of RCI): the BI is an averager
- The autocorrelation functions  $k_{wwB}$  of BI and  $k_{wwRC}$  of RCI are very different, but have equal central value  $k_{ww}$  (0)

$$k_{wwB}(0) = k_{wwRC}(0) = \frac{1}{2RC} = \frac{1}{2T_F}$$

### **Boxcar Integrator (BI): S/N enhancement**

The input wide-band noise  $S_b$  with bandwidth  $2f_n$ , autocorrelation width  $2T_n$ , has mean square value

$$\overline{n_x^2} = S_b \cdot \frac{1}{2T_n}$$

The BI output noise is

$$\overline{n_y^2} = S_b \cdot k_{wwB}(0) = S_b \cdot 1/2T_F = \overline{n_x^2} \cdot \frac{T_n}{T_F}$$

Therefore, since BI has G=1 the S/N enhancement is

$$\left(\frac{S}{N}\right)_{y} = \left(\frac{S}{N}\right)_{x} \cdot \sqrt{\frac{T_{F}}{T_{n}}}$$



The S/N enhancement does **NOT** depend **on the RATE** of the samples because it is obtained by **averaging over a given number** of samples and **not over a given time interval**. In fact, counting the samples (from the measurement time  $t_m$  and going backwards) the sample weight is reduced below 1/100 for sample number >  $4.6T_F/T_G$ , irrespective of the sample rate

## **Boxcar Integrator (BI): S/N enhancement**

The BI is equivalent to the cascade of two filtering stages

a) Acquisition of samples by a GI with same  $T_G$  and  $T_F$  as the BI, which enhances the S/N by the factor

## $\sqrt{T_G/2T_n}$

b) Exponential averaging of the samples with attenuation ratio  $r = e^{-T_G/T_F} \cong 1 - T_G/T_F$ 

which enhances the S/N by the factor

$$\sqrt{(1+r)/(1-r)} \cong \sqrt{2/(1-r)} = \sqrt{2T_F/T_G}$$

NB: this factor is INDEPENDENT of the RATE of samples, because the AVERAGE IS DONE ON A GIVEN NUMBER OF SAMPLES and not on a given time.

The S/N enhancement is thus confirmed and clarified

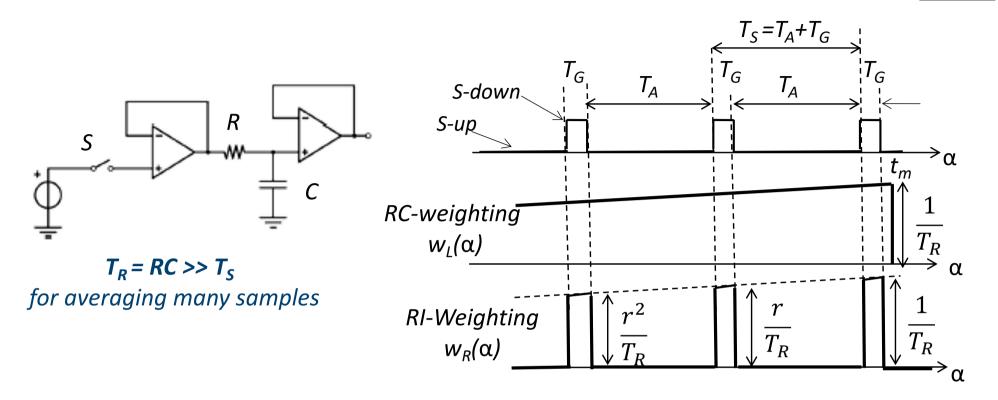
$$\left(\frac{S}{N}\right)_{y} = \left(\frac{S}{N}\right)_{x} \cdot \sqrt{\frac{T_{G}}{2T_{n}}} \cdot \sqrt{\frac{2T_{F}}{T_{G}}} = \left(\frac{S}{N}\right)_{x} \cdot \sqrt{\frac{T_{F}}{T_{n}}}$$

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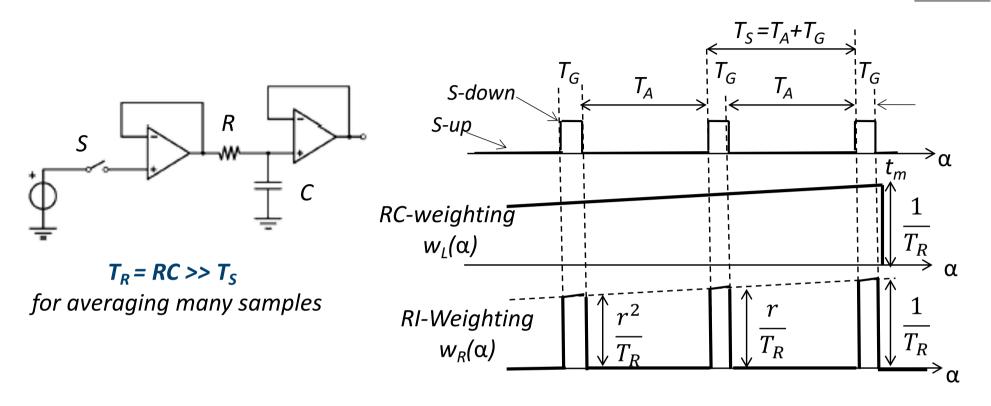
# **Ratemeter Integrator RI**

### **Ratemeter Integrator (RI)**



- By inserting a buffer between S and RC a new exponential averager is obtained, radically different from BI. The integrator is no more a switched-parameter RC filter: it is now a constant-parameter RC filter, unaffected by the switch S.
- There is no HOLD state. The memory loss goes on all the time; the weight reduction from sample to sample is  $r = e^{-(T_G + T_A)/T_F} = e^{-T_S/T_F}$ . NB: *r* DEPENDS on the sample RATE!
- During  $T_G$  (with S-down) the input is integrated in C During  $T_A$  (with S-up) the input is NOT allowed

### **Ratemeter Integrator (RI)**



- The **DC gain is G < 1** (the RC filter has G=1, but it receives just a fraction of the input!)
- With  $T_R >> T_S$  the DC gain G is proportional to the sample rate  $f_S = 1/T_S$

$$G = \int_{-\infty}^{\infty} w_R(\alpha) d\alpha \cong \frac{T_G}{T_S} \cdot \int_{-\infty}^{\infty} w_L(\alpha) d\alpha \cong \frac{T_G}{T_S} = f_S \cdot T_G$$

**NB**: if the input signal amplitude  $x_s$  is constant but  $f_s$  varies, the output signal  $y_s$  varies. In fact, the circuit is also employed as **analog ratemeter**: with constant input voltage  $x_s$  it produces a quasi DC output signal proportional to the repetition rate  $f_s$ 

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## Ratemeter Integrator (RI): S/N enhancement

The RI is equivalent to the cascade of two filtering stages

a) Acquisition of samples by a GI with same  $T_G$  and  $T_F$  as the RI, which enhances the S/N by the factor

$$\sqrt{T_G/2T_n}$$

b) Exponential averaging of the samples with attenuation ratio  $r = e^{-T_S/T_R} \cong 1 - T_S/T_R$ 

which enhances the S/N by the factor

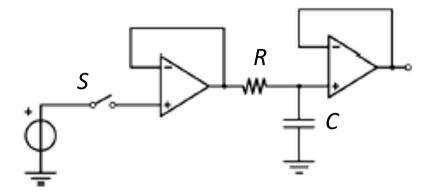
$$\sqrt{\frac{1+r}{1-r}} \cong \sqrt{\frac{2}{1-r}} = \sqrt{\frac{2T_R}{T_S}} = \sqrt{2T_R f_S}$$

NB: this factor DEPENDS on the sample RATE  $f_s$  because the AVERAGE IS DONE ON A GIVEN TIME and not on a given number of samples. The weight reduction is below 1/100 for samples that at the measurement time  $t_m$  are «older» than  $4.6 \cdot T_R$ 

The S/N enhancement thus depends on the sample rate  $f_s$ 

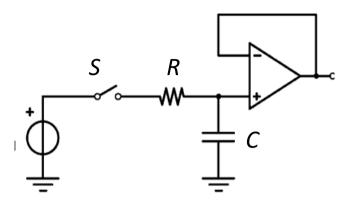
$$\left(\frac{S}{N}\right)_{y} = \left(\frac{S}{N}\right)_{x} \cdot \sqrt{\frac{T_{G}}{2T_{n}}} \cdot \sqrt{\frac{2T_{R}}{T_{S}}} = \left(\frac{S}{N}\right)_{x} \cdot \sqrt{f_{S}T_{G}\frac{T_{R}}{T_{n}}}$$

### **BI and RI: Passive Circuit comparison**



#### **RATEMETER INTEGRATOR**

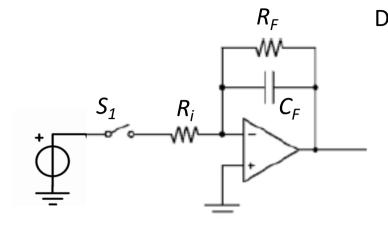
- Switch S acts as gate on the input source
- Switch S is decoupled from the RC passive filter by the voltage buffer
- The RC integrator is unaffected by S, it has constant parameters, it does NOT have a HOLD state
- The sample average is done on a given time, defined by the RC value



#### **BOXCAR INTEGRATOR**

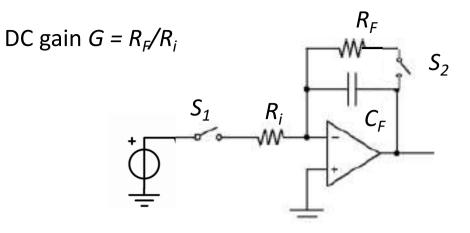
- Switch S acts as gate on the input source
- Switch S acts also on the RC passive filter (changes the resistor value)
- The time constant T<sub>F</sub> of the integrator filter is switched from finite RC (S-down) to infinite (S-up, HOLD state)
- The sample average is done on a given number of samples, defined by the  $T_F/T_G$  value

### **BI and RI: Active Circuit comparison**



#### **RATEMETER INTEGRATOR**

- Switch S<sub>1</sub> acts as gate on the input
- Switch S<sub>1</sub> is decoupled from the active RC integrator by the buffer action of the OP-AMP virtual ground
- The R<sub>F</sub>C<sub>F</sub> integrator is unaffected by S<sub>1</sub>; it has constant parameters, it does NOT have a HOLD state
- The sample average is done on a given time, defined by the R<sub>F</sub>C<sub>F</sub> value



#### **BOXCAR INTEGRATOR**

- Switch S<sub>1</sub> acts as gate on the input
- Switch S<sub>1</sub> is decoupled from the active RC integrator by the buffer action of the OP-AMP virtual ground
- A second switch S<sub>2</sub> is required for switching the time constant T<sub>F</sub> of the integrator from finite R<sub>F</sub>C<sub>F</sub> (S<sub>2</sub>-down) to infinite (S<sub>2</sub>-up, HOLD state)
- The sample average is done on a given number of samples, defined by the  $T_F/T_G$  value